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Utility Patent Application

**PERSONALIZED BEHAVIOR OF COMPUTER CONTROLLED
AVATARS IN A VIRTUAL REALITY ENVIRONMENT**

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1 **PERSONALIZED BEHAVIOR OF COMPUTER CONTROLLED AVATARS IN A VIRTUAL**
2 **REALITY ENVIRONMENT**

3 **Related Applications**

4 This application is related to U.S. Patent Application No. _____
5 [MS303874.1/MS1-1505US] entitled "MODIFIED MOTION CONTROL FOR A
6 VIRTUAL REALITY ENVIRONMENT"; U.S. Patent Application No.
7 _____ [MS303876.1/MS1-1507US] entitled "MIXTURE
8 MODELS FOR RACING MOTION LINES IN A VIRTUAL REALITY
9 ENVIRONMENT"; and U.S. Patent Application No. _____
10 [MS303948.1/MS1-1508US] entitled "PROBABILISTIC MODEL FOR
11 DISTRACTIONS IN A VIRTUAL REALITY ENVIRONMENT", all filed
12 concurrently herewith, specifically incorporated herein by reference for all that
13 they disclose and teach.
14

15 **Technical Field**

16 The invention relates generally to virtual reality environments, and more
17 particularly to personalized behavior of computer controlled avatars in a virtual
18 reality environment.
19

20 **Description**

21 Most racing-based computer games provide a mode for competing against
22 computer-controlled opponents that use a simple form of artificial intelligence
23 (AI) to negotiate the race track or course in a simulated "human-like" fashion.
24 However, despite the "human-like" goal of such AI, the result tends to appear
25 quite non-human upon close observation. For example, the computer opponent

1 may travel along an ideal or prescribed racing line on the course, whereas a human
2 competitor inadvertently introduces continuous imperfections into his or her
3 driving, such as over/under turning, over/under accelerating, over/under braking,
4 and early/late reactions. However, it is just such imperfections that characterize a
5 "human-like" competitor. As a result, computer opponents tend to become
6 predictable and less interesting.

7 One reason for the non-human like behavior of some AI competitors is that
8 a typical AI motion control system effectively provides a computer opponent with
9 a reaction time of $1/60^{\text{th}}$ of a second in the USA or $1/50^{\text{th}}$ of a second in Europe
10 (i.e., for each frame repaint interval in the virtual reality environment). Therefore,
11 computer control of the AI opponent in reaction to any "visual" (e.g., distance to a
12 corner) and "physical" (e.g., loss of traction) stimuli from the virtual reality
13 environment occurs 50 or 60 times a second. No human player can react so
14 quickly, so frequently, or so perfectly as to compete with such an ideally-
15 performing computer controlled opponent.

16 Therefore, another popular feature of such games is the opportunity to
17 compete against one or more human competitors. For example, two friends can
18 compete against each other at the same console or over a network. Such human
19 vs. human competition typically offers a much more varied and interesting race
20 because human competitors tend to develop their own styles of racing and make
21 significant, non-ideal moves during the race. The result is often a more dynamic,
22 unpredictable, and exciting competition. However, when there are no human
23 competitors available, a human player is generally stuck with playing the very
24 non-human AI controlled competitor.

1 Implementations described and claimed herein enhance the human-like
2 realism of computer opponents in racing-type games and other computer games.
3 In one implementation, personalized training data is parameterized and recorded
4 for a human subject. Thereafter, a computer controlled avatar may be generated to
5 emulate the style (e.g., strategy, tactics, skill, and short-comings) of the human
6 subject. In this manner, a human player may compete against a more human-like
7 AI control competitor modeled on the human subject. Furthermore, this avatar
8 may be personalized to perform like a friend or a famous competitor in the real
9 world. In addition, the behavior of the avatar may be varied based on variations of
10 the human subject's behavior over multiple training sessions for each game
11 segment to provide a less predictable gaming experience.

12 In various implementations, articles of manufacture are provided as
13 computer program products. One implementation of a computer program product
14 provides a computer program storage medium readable by a computer system and
15 encoding a computer program for a virtual reality environment. Another
16 implementation of a computer program product may be provided in a computer
17 data signal embodied in a carrier wave by a computing system and encoding the
18 computer program for a virtual reality environment.

19 The computer program product encodes a computer program for executing
20 on a computer system a computer process for a virtual reality environment. An
21 avatar behavior definition is computed based on environmental context of a virtual
22 reality environment and a randomly selected training behavior from a training set
23 of personalized sample behaviors. At least one control signal is generated to guide
24 behavior of an entity in the virtual reality environment in accordance with the
25 avatar behavior definition.

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2 In another implementation, a method is provided, such that an avatar
3 behavior definition is computed based on environmental context of a virtual reality
4 environment and a randomly selected training behavior from a training set of
5 personalized sample behaviors. At least one control signal is generated to guide
6 behavior of an entity in the virtual reality environment in accordance with the
7 avatar behavior definition.

8 In yet another implementation, a system is provided. An avatar behavior
9 definition module computes an avatar behavior definition based on environmental
10 context of a virtual reality environment and a randomly selected training behavior
11 from a training set of personalized sample behaviors. A behavior control system
12 generates at least one control signal to guide behavior of an entity in the virtual
13 reality environment in accordance with the avatar behavior definition.

14 Brief descriptions of the drawings included herein are listed below.

15 FIG. 1 illustrates a race course and two training racing lines for use in
16 parameterizing an exemplary computer controlled avatar.

17 FIG. 2 illustrates an exemplary system for generating a personalized
18 training data.

19 FIG. 3 illustrates exemplary personalized training data.

20 FIG. 4 illustrates an exemplary system for generating control signals for a
21 computer controlled avatar.

22 FIG. 5 illustrates exemplary operations for generating control signals for a
23 computer controlled avatar.

24 FIG. 6 illustrates an exemplary system useful for implementing an
25 embodiment of the present invention.

1 Racing-based computer games typically include a mode in which one or
2 more human players can compete against one or more computer-controlled
3 opponents. For example, a human player may drive a virtual race car against a
4 computer-controlled virtual race car purported to be driven by Mario Andretti or
5 some other race car driver. As described herein, such computer controlled
6 opponents may be enhanced by including a sampling of actual game behavior of a
7 human subject. Such a sampling can allow the game system to personalize the
8 behavior of the computer control opponent to emulate the human subject.

9 In this manner, the computer controlled opponent may be personalized to
10 behave like famous competitors in the field or like friends and family of the
11 human player. For example, two friends are playing a computer racing game
12 before one of the friends needs leave. The departing friend can enter a training
13 mode to create personalized training data storing it in a persistent storage medium
14 accessible by the gaming system. The remaining friend can then choose to play an
15 avatar that is personalized by that training data to emulate his or her departed
16 friend. Likewise, training data may be generated and/or obtained for more famous
17 participants (e.g., Mario Andretti) and then stored in a persistent storage medium
18 accessible by the gaming system.

19 FIG. 1 illustrates a race course and two training racing lines for use in
20 parameterizing an exemplary computer controlled avatar. A virtual race
21 course 100 includes a racing surface 102 and an infield 104. It should be
22 understood that an alternative course may not be closed or may be applied to a
23 non-racing environment, such as a first person shooter game, a military simulation,
24 or a reality simulation. As such, a computer controlled driver may be replaced by
25 a computer controlled (or AI controlled) player represented by any moving object.

1 Two exemplary training racing lines 106 and 108 are shown within the
2 virtual race course 100. Notice that, in one lap, the human driver hit the wall
3 at 109. Such imperfections contribute to the experience of competing against a
4 human competitor. Racing lines, examples of behavior definitions, may be
5 characterized by various parameters, including without limitation locations on the
6 course, and steering, braking, speed, and acceleration parameter sequences. Such
7 training racing lines may be captured, for example, by monitoring and recording a
8 human driver's performance during multiple laps of a race.

9 The training racing lines 106 and 108 are used to develop personalized
10 training data specific to the human subject that recorded them. Using this
11 personalized training data, the system controls the AI controlled avatar to emulate
12 the human subject's performance. Multiple racing lines provide additional
13 variation that contributes to the unpredictable behavior of the AI controlled avatar.

14 During a race, at a specified interval (such as a simulation interval or a
15 frame interval, which may be equal in some implementations), an AI motion
16 control system receives stimulus inputs and computes control signals based on
17 these inputs to change the direction, speed, etc. of the computer racing vehicle or
18 other entity. The changes are generally intended to bring the AI driver back into
19 alignment with a racing line (such as an ideal racing line or a personalized racing
20 line). As such, a racing line is a form of a behavior definition that provides
21 guidance to the AI motion control system in controlling the AI driver's path along
22 the track.

23 A course is divided up into track segments (see, for example, track
24 segment 110). Generally, track segments are a type of game segment, which may
25

1 also represent a game turn in a strategy game, a scene in a role playing game, a
2 level in a first person shooter, etc., or combinations thereof.

3 Each racing line is characterized relative to waypoints (such as
4 waypoints 112, 114, 116, and 118) within a track segment. Track segments are
5 examples of a more generic game segment, such as a distance through a maze, one
6 or more rooms in a virtual reality setting, etc. In one implementation, for example,
7 at waypoint 118, a steering angle 120 between a normal vector (normal to the
8 waypoint line across the track) and the sampled racing line characterizes the racing
9 line to the system. Waypoints and the steering angles are then used by the AI
10 motion control system to compute proper motion control signals for the AI
11 controlled entity (e.g., the racing vehicle).

12 FIG. 2 illustrates an exemplary system 200 for generating a personalized
13 training data. A set of personalized training samples 202 are generated and input
14 to the training module 204. In one implementation, personalized training samples
15 are generated by monitoring performance of a human subject during game play.
16 Characteristics of the environment (e.g., track geometry, track conditions, etc) and
17 subject's behavior (e.g., a racing line, control signals, etc.) are parameterized and
18 recorded in personalized training data 206. In at least one implementation, the
19 personalized training data may be persistently stored to allow the human player to
20 save training data profiles of various avatar competitors.

21 FIG. 3 illustrates exemplary personalized training data 300 including
22 personalized sample behaviors. Each row corresponds to a particular game
23 segment, as represented by the track segment pictorials along the leftmost column.
24 The first column of each row represents a given game segment in the course. Each
25 game segment may be represented by game segment descriptors, which may

1 include without limitation track segment geometry, track surface conditions, time
2 of day, etc. Each subsequent column corresponds to a sample of the human
3 subject's behavior (i.e., personalized sample behaviors) in the associated game
4 segment.

5 In addition, the rate of accumulating personalized training data may
6 effectively be increased by "mirroring" training data for a given track segment,
7 thereby doubling the amount of training data extracted for a given amount of
8 training. For example, for some track segments, by extracting training data for a
9 right hand turn and then mirroring both the track segment (to represent a left hand
10 turn) and the personalized racing line sample, two training samples are captured
11 for a single track segment.

12 In the illustrated table 300, the sample of the human subject's behavior is
13 represented by a racing line for that track segment. As shown in the last row, for
14 example, the human subject provided four sample behavior definitions (e.g.,
15 racing lines) for the associated track segment, which appears to be a sharp curve.
16 Differences among the behavior definitions taken by the human subject can be
17 seen in each cell in that row, thereby providing the opportunity to contribute to the
18 unpredictable behavior of the AI avatar on this track segment or a track segments
19 that are similar to this track segment.

20 In one implementation of a racing game, a racing line may be defined by a
21 sequence of steering angle values at waypoints in a track segment. A steering
22 angle value characterizes the steering angle of the racing line relative to a vector
23 that is normal to the waypoint lines in the track segment. It should be understood
24 that racing lines may be characterized by other parameters or combinations of
25 other parameters, including without limitation sampled locations or vectors within

1 the course, game play actions (e.g., fight sequences), etc. In an implementation of
2 a first person shooter game, a behavior definition may represent a player's
3 movement path.

4 The track segments included in the training set may or may not be from the
5 current track. In one implementation, a probability density function operation
6 determines similarities between training track segments and the current track
7 segment and computes weighted contributions by sampling racing lines associated
8 with each similar training track segment. The weighting may apply contributions
9 of one or more sample racing lines to the AI avatar's current racing line within the
10 current track segment. In an alternative implementation, personalized avatars may
11 be executed only on tracks on which the human subject has actually trained.

12 FIG. 4 illustrates an exemplary system 400 for generating control signals
13 for a computer controlled avatar. Personalized training data 402 may be provided
14 in a variety of ways, including dynamic generation of the training data based on
15 past or concurrent game play by the human subject, downloading training data
16 from a web resource or storage media, computing training data for fictitious
17 players, etc. Note: With the concurrent game play option, a player could compete
18 against an increasingly improving avatar of himself or herself by starting with an
19 initial set of default or personalized training data and adding to the training set as
20 the player plays the game. As the game play proceeds, the racing lines taken by
21 the user during the game may be added to the training data to enhance the richness
22 of the training samples.

23 Environmental context information 404 relating to the game segment is
24 provided by the virtual reality environment, such as track location, track segment
25 geometry, etc. The context information parameters, which are similar in format

1 and/or content to the track segment descriptors, are used to match one or more
2 track segments in the training data 402, so as to identify personalized sample
3 behaviors that contribute to the behavior definition of the AI controlled avatar.

4 The training data 402 and the context information 404 are received by an
5 avatar behavior definition module 406, which computes a behavior definition 408.
6 In one implementation, the behavior definition 408 specifies a personalized racing
7 line to be followed by the AI behavior control system 410. However, other
8 behavior definitions may also be specified, such as an AI avatar's behavior in a
9 first person shooter game, etc.

10 In one implementation, an avatar behavior definition module 406 randomly
11 selects a sample index (e.g., to select a column of sample data) and evaluates the
12 segment descriptors against the context information 404 to identify appropriate
13 sample data. The sample behavior for the best matching track segment under the
14 randomly selected index may be forwarded as the behavior definition 408 to the
15 AI behavior control system 410.

16 In another implementation, a probability density function module 412
17 determines the weighted contribution that one or more samples provides to a
18 behavior definition for a given track segment. The higher the similarity between
19 the context information 404 and the track segment descriptor, the greater the
20 weight applied to the sample data when computing the behavior definition. The
21 weighted sum of these contributions is then forwarded as the behavior
22 definition 408 to the AI behavior control system 410. Other contribution
23 algorithms are also contemplated.

24 Stimuli 414 from the virtual reality environment is input to the AI behavior
25 control system 410, which generates control signals 416 for controlling the avatar

1 in the virtual reality environment. The control signals 416 are input to an
2 implementation engine 418 to implement the motion or behavior specified by the
3 control signals 416. For example, the implementation engine 418 may cause a
4 virtual race car to change direction and speed.

5 FIG. 5 illustrates exemplary operations 500 for generating control signals
6 for a computer controlled avatar. A receiving operation 502 receives personalized
7 training data. Another receiving operation 504 receives context information for
8 the track segments of the current track.

9 A generation operation 506 generates an avatar behavior definition for each
10 track segment of the current track. In one implementation, a sample index is
11 randomly selected and the sample data corresponding to the track segment having
12 the closest match with context information 504 of the current track is deemed the
13 avatar behavior definition for the current track segment. This selection and
14 evaluation to identify the avatar behavior definition for a current track segment is
15 repeated for each track segment in the current track.

16 In another implementation, sample data from multiple track segments in the
17 training data may contribute to the avatar behavior definition for a given track
18 segment of the current track. Assume that BD_i represents the behavior definition
19 for a given track segment i in the current track and SD_{jk} represents the sample
20 data from row j , column k_j of the training data. An exemplary algorithm is
21 described below:

- 22 1 For all track segments i in current track
- 23 2 For all track segments j in the training data
- 24
- 25

1 3 k_j =randomly selected sample index over all sample
2 columns in the training data
3
4 4 $s_j = e^{-\frac{\|\tau_i - \tau_j\|^2}{2\omega^2}}$, wherein s_j represents a weighting factor
5 for the j^{th} track segment in the training data, τ_i
6 represents the context information for the i^{th}
7 track segment in the current track, τ_j represents
8 the track descriptor of the j^{th} track segment in
9 the training data, and ω represents a sensitivity
10 factor
11 5 End
12 6 Normalize s_j (e.g., $s_j' = \frac{s_j}{\sum_j s_j}$)
13
14 7 $BD_i = \sum_j s_j' \cdot SD_{j|k_j}$
15
16 8 End

17 The sensitivity factor ω specifies how sensitive the weighting factor is to
18 similarities. For example, if ω is very small, then s_j is small and sample data for
19 fewer training track segments contribute heavily to the behavior definition BD_i . In
20 contrast, if ω is very large, then s_j large and sample data for more training track
21 segments contribute heavily to the behavior definition BD_i . The sensitivity factor
22 ω may be preset at game design time or configured by the player or the system.

23 In one implementation, avatar behavior definitions for all track segments of
24 the current track are computed before race time (e.g., to conserve computational
25 capacity for other functions during race time). However, it should also be

1 understood that, in an alternative implementation, avatar behavior definitions for
2 individual track segments in the current track may be dynamically computed as the
3 track segment is encountered in the virtual reality environment. This approach
4 allows race time events to be considered when determining matches with training
5 data. In addition, a human player's behavior during the current race may be used
6 to dynamically supplement the training data during the race (e.g., to allow the
7 human player to compete against a continually changing avatar of himself or
8 herself).

9 A receiving operation 508 receives game stimuli from the virtual reality
10 environment for the current simulation interval. Such stimuli is input to a
11 generation operation 510, which generates the control signals used to converge
12 avatar behavior to the avatar behavior definition (e.g., generated in the generation
13 operation 506) based on the stimuli. For example, the control signals in a racing
14 game are generally intended to steer the AI control vehicle toward a racing line.

15 An implementation operation 512 applies the control signals to the virtual
16 reality environment through an implementation module. For example, exemplary
17 implementation modules may include a racing physics engine. Operations 508,
18 510, and 512 repeat each simulation interval to progress the action in the virtual
19 reality game.

20 The exemplary hardware and operating environment of FIG. 6 for
21 implementing the invention includes a general purpose computing device in the
22 form of a computer 20, including a processing unit 21, a system memory 22, and a
23 system bus 23 that operatively couples various system components include the
24 system memory to the processing unit 21. There may be only one or there may be
25 more than one processing unit 21, such that the processor of computer 20

1 comprises a single central-processing unit (CPU), or a plurality of processing
2 units, commonly referred to as a parallel processing environment. The computer
3 20 may be a conventional computer, a distributed computer, or any other type of
4 computer; the invention is not so limited.

5 The system bus 23 may be any of several types of bus structures including a
6 memory bus or memory controller, a peripheral bus, and a local bus using any of a
7 variety of bus architectures. The system memory may also be referred to as
8 simply the memory, and includes read only memory (ROM) 24 and random access
9 memory (RAM) 25. A basic input/output system (BIOS) 26, containing the basic
10 routines that help to transfer information between elements within the computer
11 20, such as during start-up, is stored in ROM 24. The computer 20 further
12 includes a hard disk drive 27 for reading from and writing to a hard disk, not
13 shown, a magnetic disk drive 28 for reading from or writing to a removable
14 magnetic disk 29, and an optical disk drive 30 for reading from or writing to a
15 removable optical disk 31 such as a CD ROM or other optical media.

16 The hard disk drive 27, magnetic disk drive 28, and optical disk drive 30
17 are connected to the system bus 23 by a hard disk drive interface 32, a magnetic
18 disk drive interface 33, and an optical disk drive interface 34, respectively. The
19 drives and their associated computer-readable media provide nonvolatile storage
20 of computer-readable instructions, data structures, program modules and other
21 data for the computer 20. It should be appreciated by those skilled in the art that
22 any type of computer-readable media which can store data that is accessible by a
23 computer, such as magnetic cassettes, flash memory cards, digital video disks,
24 Bernoulli cartridges, random access memories (RAMs), read only memories
25 (ROMs), and the like, may be used in the exemplary operating environment.

1 A number of program modules may be stored on the hard disk, magnetic
2 disk 29, optical disk 31, ROM 24, or RAM 25, including an operating system 35,
3 one or more application programs 36, other program modules 37, and program
4 data 38. A user may enter commands and information into the personal computer
5 20 through input devices such as a keyboard 40 and pointing device 42. Other
6 input devices (not shown) may include a microphone, joystick, game pad, satellite
7 dish, scanner, or the like. These and other input devices are often connected to the
8 processing unit 21 through a serial port interface 46 that is coupled to the system
9 bus, but may be connected by other interfaces, such as a parallel port, game port,
10 or a universal serial bus (USB). A monitor 47 or other type of display device is
11 also connected to the system bus 23 via an interface, such as a video adapter 48.
12 In addition to the monitor, computers typically include other peripheral output
13 devices (not shown), such as speakers and printers.

14 The computer 20 may operate in a networked environment using logical
15 connections to one or more remote computers, such as remote computer 49. These
16 logical connections are achieved by a communication device coupled to or a part
17 of the computer 20; the invention is not limited to a particular type of
18 communications device. The remote computer 49 may be another computer, a
19 server, a router, a network PC, a client, a peer device or other common network
20 node, and typically includes many or all of the elements described above relative
21 to the computer 20, although only a memory storage device 50 has been illustrated
22 in FIG. 6. The logical connections depicted in FIG. 6 include a local-area network
23 (LAN) 51 and a wide-area network (WAN) 52. Such networking environments
24 are commonplace in office networks, enterprise-wide computer networks, intranets
25 and the Internet, which are all types of networks.

1 When used in a LAN-networking environment, the computer 20 is
2 connected to the local network 51 through a network interface or adapter 53,
3 which is one type of communications device. When used in a WAN-networking
4 environment, the computer 20 typically includes a modem 54, a type of
5 communications device, or any other type of communications device for
6 establishing communications over the wide area network 52. The modem 54,
7 which may be internal or external, is connected to the system bus 23 via the serial
8 port interface 46. In a networked environment, program modules depicted relative
9 to the personal computer 20, or portions thereof, may be stored in the remote
10 memory storage device. It is appreciated that the network connections shown are
11 exemplary and other means of and communications devices for establishing a
12 communications link between the computers may be used.

13 In an exemplary implementation, AI motion control systems, physics
14 engines, training modules, avatar control modules, avatar behavior definition
15 modules, AI behavior control modules, or other modules may be incorporated as
16 part of the operating system 35, application programs 36, or other program
17 modules 37. The stimuli signals, behavior definitions, training data, context
18 information, and control signals may be stored as program data 38.

19 The embodiments of the invention described herein are implemented as
20 logical steps in one or more computer systems. The logical operations of the
21 present invention are implemented (1) as a sequence of processor-implemented
22 steps executing in one or more computer systems and (2) as interconnected
23 machine modules within one or more computer systems. The implementation is a
24 matter of choice, dependent on the performance requirements of the computer
25 system implementing the invention. Accordingly, the logical operations making

1 up the embodiments of the invention described herein are referred to variously as
2 operations, steps, objects, or modules.

3 The above specification, examples and data provide a complete description
4 of the structure and use of exemplary embodiments of the invention. Since many
5 embodiments of the invention can be made without departing from the spirit and
6 scope of the invention, the invention resides in the claims hereinafter appended.